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USING THEORETICAL DESCRIPTORS IN STRUCTURE ACTIVITY RELATIONSHIPS III. ELECTRONIC DESCRIPTORS

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Electronic descriptors

PREFACE

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USING THEORETICAL DESCRIPTORS IN STRUCTURE ACTIVITY RELATIONSHIPS III. ELECTRONIC DESCRIPTORS

1 INTRODUCTION

Quantitative Structure-Activity Relationships (QSAR) have been used successfully in the past to correlate a variety of activities with many empirically derived and structure based descriptors (1 - 8). QSAR is a generalization of Linear Free Energy Relationships (LFER) and is based on work by Hammet in which he derived electronic descriptors for the dissociation of substituted benzoic acids and their esters (9). The basic tenet behind QSAR is that there is a connection between the microscopic (molecular structure) and macroscopic (empirical) properties suc: that it may be possible to predict empirical properties from the molecular structure. Molecular structure based properties, referred to as descriptors, can be calculated with computational chemistry techniques.

1.1 Quantitative Structure-Activity Relationships (QSAR)

The Quantitative Structure-Activity Relationship (QSAR) concept suggests that there can be a mathematical relationship between the molecular structure of a compound and its activity in a system. Several different structural descriptors have been used in QSAR equations. These range from experimentally determined pi and sigma to quantum mechanical energy levels. Activity, as used in QSAR, is defined as some chemical, physical or biological property. One example is the reciprocal of the dose of some substance required to produce a biological response. A chemical example is the distribution of a solute between two solvents.

A very important consequence of the QSAR idea is that if a mathematical structure-activity relationship can be found for a series of compounds the activity of some related compound can be predicted. Of the many possible mathematical relations a linear function is the simplest mathematically and conceptually and can be shown to be a valid possibility for QSAR.

1.2 Linear Relationships

The possibility of using linear relationships can be suggested by heuristic arguments which use kinetics and thermodynamics.

The familiar linear relationship between log K, where K is the equilibrium constant, and the standard Gibbs free energy change, Δ G, for a given process is stated in (eqn.1).

$$\Delta G = -2.30 R T log K (eqn.1)$$

If there is a linear relationship between log A, the logarithm of the activity, A, and log K then there is a linear relationship between log A and the Gibbs free energy change. A linear relationship between log A and log K can be obtained using an argument based on a reaction mechanism and an equilibrium constant expression (10).

A short explanation is based on the idea that the dose is related to the concentration of a reactant while the response of the system can be related to the concentration of a product. These concentrations can be related through an equilibrium concentration expression. The activity can

be taken as a function of a concentration. The equilibrium constant expression involves mathematical products of concentrations with some factors having negative exponents. Taking the logarithm of this mathematical product produces an algebraic sum of logarithms, a sum of logarithms is linear in those logarithms. As a result there can be linear relation between the log A and log K.

Since there is a linear relationship between the log A and log K then (eqn.1) indicates that there is a linear relationship between log A and the gibbs free energy change. The relationship between ΔG , ΔH , and $T\Delta S$ as shown in (eqn.2) can, by simple substitution show that ΔH is linearly related to log A.

$$\triangle H - T \triangle S = \triangle G$$
 (eqn.2)

This is the basis for the Linear Free Enthalpy Relationships (LFER). (Since the free energy and the enthalpy differ by T \triangle S they have been interchanged freely.) LFER represents a subset of the QSAR concept.

A connection between the LFER and structure was made by Hammett through an analysis of dissociation constants for a series of benzoic acid derivatives (9). The difference between the Gibbs free energy changes for the dissociation of each acid was assumed to be due to the difference between their structures. This difference is associated with a functional group. Sigma is an empirical descriptor that is defined by the relation. A $G(2)-\Delta G(1)=-2.30$ R T of and its equivalent form, $\log K(2)-\log K(1)=\sigma'$. Hammett realized that this descriptor was, in fact, related to the electron withdrawing power of a particular attached group. This relationship and many generalizations made from it have formed the basis

behind LFER and subsequently, QSAR.

1.3 Linear Solvation Energy Relationships

Kamlet and Taft extended the LFER approach to the interaction of solutes and solvents (1,2). The interaction between a solvent and solute is a solvation process and the associated energy change is called a solvation energy. This type of Linear Free Enthalpy Relationship is called a Linear Solvation Energy Relationship (LSER).

Taft, Kamlet and co-workers correlated over 100 properties with what they call solvatochromatic parameters(1,2,3). The equation has the general form shown in (eqn.3) (4):

LSER = cavity term + polarizability term + hydrogen bonding term + intercept. (eqn.3.)

The cavity term involves a volume (molar volume for solutes; Hildebrand solubility parameter for solvents). The polarizability and hydrogen bonding terms (one each for acidity and basicity) are expressed in terms of the solvatochromatic parameters which are obtained from UV-VIS spectroscopy.

The solvatochromatic parameters are empirical in nature; this means that the compound ora series mof compounds have to be synthesized and the parameters measured. Once the parameters, are measured the activity (dependent property, whatever the LSER represents) can be correlated with these parameters.

1.4 Example Of The Application Of LSER

An example of solute-solvent interaction is the distribution (partitioning) of hexane between octanol and water as represented by the following chemical equation:

The equilibrium constant expression is given by

provides a convenient model for LSER studies since the partition coefficient, Kow, is easily measured and can be taken as the measure of activity for the system. Kamlet and Taft have log Kow data for over 70 compounds and have done extensive analysis on this system (2). Furthermore the partition coefficient provides a parameter which models the lipophylic-hydrophylic blood-brain barrier.

One major difficulty with empirical descriptors is that the compound(s) in either the initial correlations, or subsequent predictions, have to be synthesized and the descriptors measured. This, to a large degree, detracts from the idea of property or activity prediction. The incorporation of descriptors directly derived from the structure of the made equal into the QSAR equations can potentially yield relationships where predictions of activities can be made without synthesis of the target compounds.

Replacing an equation using empirical descriptors with an equation using theoretical or computationally derived descriptors makes it possible to predict the activity (properties) of a compound a priori. In addition using theoretical or computational descriptors in place of empirical descriptors is a more direct application of the the structure-activity relationship concept. Laboratory measurments are required in order to find the LSER empirical descriptors and require considerable lab space, time. and chemicals (some of which may be expensive or toxic). If molecular structure descriptors can be obtained by computational chemistry techniques then laboratory space, time and chemicals can be conserved. Furthermore the results of the computations can provide insights into the fundamental processes involved.

Calculated molecular descriptors have been used in structure-activity relations. For example Kaliszan and co-workers have used quantum chemical parameters in quantitative structure-retention relations (QSRR) involving gas chromatographic retention times (5,6). They were able to fit data with a linear relationship. Another example of QSRR is the work of Dunn and co-workers who have used molecular mechanics to obtain a molecular surface area which they correlated with the gas chromatographic retention index (7).

At the Chemometric/Biometric Modeling Branch of the Chemical Research, Development and Engineering Center (CRDEC) work has been done toward finding molecular parameters that can replace or correlate well with the terms in (eqn.3). The computational facilities there have been used to

demonstrate that the cavity term in (eqn.3) can be represented by the molecular volume (4). In addition the polarizability term in (eqn.3) can be well represented by a molecular polarizability parameter (7).

1.6 Scope Of This Report

The purpose of this paper was to search for a molecular parameter to represent the hydrogen bonding term in (eqn.3). Some of the descriptors that have been used will be described and suggestions will be made other descriptors.

The system and process employed is the distribution of hexane between two phases, octanol and water, as represented in (eqn.4) above. The partition coefficient, Kow, will be taken as a measure of the activity of the hexane in this system.

Molecular descriptors which have been used in this laboratory to attempt to model hydrogen bonding basicities include the following: dipole moment; formal charges; a charge interaction which was a sum of products of pairs of charges divided by the square of the number of atoms; a charge-surface quantity which involved the double sum of atomic formal charges times the atomic areas divided by the double sum of the product of the atomic areas; and a surface weighted root-mean-square charge parameter which is a sum of the squares of the atomic formal charges times the atomic area divided by the total area. These quantities gave very poor statistical measures of fit as indicated by low values of the multiple correlation coefficients (11).

2 EXPERIMENTAL

The experimental work involved the use of the computational facilities at the Chemometric/Biometric Modeling Branch of the Chemical Research, Development, and Engineering Center (CRDEC).

A general procedure was instituted for developing predictive equations. First, molecular models are devised to describe hydrogen bonding. Then a set of compounds is selected. For each compound, the initial molecular geometry (bond distances, bond angles, dihedral angles and atomic connections) are set up and semi-empirical quantum chemical techniques are employed to optimize the geometry and produce electronic parameters. These geometric and electronic parameters are used to calculate other quantities required for the hydrogen bonding model. Finally a statistical (multiple linear regression) analysis, using log Kow as the dependent variable, is done on the set of data that has been produced and the results are evaluated for statistical significance, inter-descriptor correlations and physical content.

2.1 Chemical Computational Facilities

Geometrical optimization was done using programs available in MOPAC, A General Molecular Orbital Package (12). Specifically employed were MNDO (minimum neglect of differential overlap) and AM1; these programs produce files containing the geometry, energy and electron population. AM1 is a program which is designed to give a good representation for hydrogen bonding (13).

Charge and size related parameters were calculated using programs from the Molecular Modeling, Analysis and Display System (MMADS) (14). This software package was developed at the Chemometric/Biometric Modeling Branch of the CRDEC. Two programs, CONOLLY and AREA, are available to calculate types of molecular surface areas. Another program, ELECTOP, was added to MMADS to calculate the topological electronic index. In addition STICK was used to display the input and optimized structures and to help set up the input geometries. ZINDO was used to produce an electron population from the optimized geometry. ZINDO uses the semi-empirical INDO/S (intermediate neglect of orbital overlap) methodology (14).

2.2 Descriptor Models

Several different approaches were used to model hydrogen bonding. A major assumption is that hydrogen bonding is related to size and electronic characteristics. Hydrogen bonding occurs with atoms that have a high electronegativity; this is correlated with small size and five or more valence electrons. Inherent in structure-property correlations is the idea that bond energies are determined by such size and charge properties. This suggests an alternate approach of directly calculating a measure of the bond energy by using energy parameters that result from the quantum chemical calculations.

The descriptors chosen are described in the following sections.

2.2.1 Topological Electronic Index

Kaliszan and co-workers defined a quantum chemical parameter called the topological electronic index, T(E). It combines electronic and geometric descriptors. They used it in the correlation analysis of gas-liquid chromatographic retention indices (QSRR) (5,6). The topological electronic index is a measure of the differences in solute molecular constitution, shape and size and is defined by the following relation:

$$T(E) = \sum_{i \neq i} abs[fc(i)-fc(j)]/r(i,j)2 \quad (eqn.5)$$

The sum does not include terms with i=j as this would give an indeterminate form. T(E) is the topological electronic index; fc(i) is the negative of the excess electron population density (formal charge). The r(i,j) values are the internuclear distances.

A physical interpretation of the topological electronic index can be made by recognizing that each term involves a coulombic interaction and represents the magnitude of an electric field strength at a distance, r(i,j), away from a charge of size, (fc(i)-fc(j)).

The distances and electron populations are obtained using quantum chemical calculations. The distances were obtained from the optimized geometry produced with the program, MNDO. The formal charges were calculated using the program, ZINDO, which is better for electronics (15). The program, ELECTOP, was written in FORTRAN (and incorporated into MMADS) for the purpose of calculating the topological electronic index.

Three other variations of the topological electronic index were also used. The first one, labeled T(E)2, used the square of the difference in the formal charge in place of the first power in the definition, (eqn.5). The other two were the analogues of the first two with the formal charges replaced by the electron populations. These were represented by T(E,P) and T(E,P)2.

The topological electronic index was combined with the molecular volume and the solute-solvent contact area (SCA) to produce other descriptors. The solute-sovent contact area is described in the next section and the molecular volumes were described by Famini (4).

2.2.2 Solvent Contact Area

Since it is a geometrical descriptor a surface area, by itself, would not be an adequate electronic descriptor since it does not include the charge. In addition it correlates highly with the molecular volume. However, the part of the solute surface area which can be touched by a solvent molecule might provide a measure of the size contribution to hydrogen bonding. This solute-solvent contact area (SCA) is defined as the area of the surface of the solute molecule which a solvent molecule can touch (16). This would depend on the size (radius) of the solvent molecule and the shape of the solute molecule. The solute molecule is treated as sphere. The solvent contact area (SCA) was calculated with the program, CONOLLY (17), which has been incorporated within MMADS.

One choice of a function involving charge and size would be the product of the topological index and an area. It would have units of electrical charge only.

2.2.3 Bond Energies

Two approaches were used to model the hydrogen bond more directly.

They are represented by the following processes:

compound
$$(g) + H(+1)(g) == compoundH(+1)(g)$$
 (eqn.6)

and

compound
$$(g) + H2O(g) ==> compound H2O(g)$$
 (eqn.7)

Reaction enthalpies for the reaction involving H(+1) (eqn.6) were calculated using enthalpies of formation obtained with the program, MNDO, while those for the reaction involving H2O (eqn.7) were calculated using the program, AM1. As in most quantum chemical calculations, the results apply only to gaseous state molecules where there are no inter-molecular interactions.

3 RESULTS

Each descriptor chosen was employed as the hydrogen bonding term in the following version of (eqn.3):

logKow = a(molecular volume) + b (polarizability) + c (descriptor) + d (eqn.8)

The molecular volume and polarizability data were obtained from references (4) and (8). The set of data was analyzed using a multiple linear correlation analysis contained in the HASSLE statistical package which is available from the DEC Users Society (DECUS) library. The results for the goodness of fit are summarized by model below. Numerical values for selected descriptors are listed in table A.

The symbols employed are listed here.

T(E) = topological electronic index

 $T(E)^2 = topological electronic index with squared charge$

T(E,P) = topological electronic index based on electron populations

 $T(E,P)^2 = topological$ electronic index with squared charge based on electron populations

McVol = molecular volume

SCA = solvent contact area

 $\Delta H(6)$ = enthalpy of reaction with H(+1) (eqn.6)

 $\Delta H(7)$ = enthalpy of reaction with H2O (eqn.7)

n = number of compounds, sample size

R = multiple correlation coefficient

SEE = standard error of the estimate

	Descriptor	R	SEE
		qui tile suis-adil diq	
n = 72			
	T(E)	0.890	0.555
	T(E)/McVol	0.894	0.545
	SCA	0.667	0.908
	T(E)/SCA	0.914	0.496
	T(E)*SCA	0.858	0.625
20			
n=38			
	∆ H(6)	0.351	1.25
	T(E)^2	0.705	0.948
	T(E)^2/McVol	0.736	0.905
	T(E)/SCA	0.747	0.889
	T(E,P)	0.514	1.15
	T(E,P)/McVol	0.409	1.28
	T(E,P)/SCA	0.475	1.18

The values for the enthalpy change in the reaction with H(+1) (eqn.6) were not analyzed statistically. That model was rejected for physical reasons. In some cases a hydrogen atom was extracted from the molecule to produce a hydrogen molecule and a positive (-onium) ion. That was a much stronger interaction than expected for hydrogen bonding.

Calculations with the modified version of the topological electronic index, T(E,P)2, were not pursued after calculations with T(E,P) showed low multiple correlation coefficients.

Using the best hydrogen bonding descriptor, T(E)/SCA, (eqn.8) can be written explicitly as follows:

log Kow =
$$(2.97 +/- 0.25)*McVol/100 + (0.77 +/- 65.9)*PI*10 +$$

 $(-3.15 +/- 0.23)*T(E)/(SCA*100) - 0.0739$ (eqn.9)

n = 72 R = 0.914 SEE = 0.496

PI is the molecular polarizability as described in reference (8).

4 DISCUSSION

The statistical quantities tabulated for the models in the results section form the basis for judging the quality of the descriptor models.

In the above list the best descriptor for hydrogen bonding is the topological electronic index divided by the solvent contact area. By themselves the topological electronic index and the solvent contact area give a low correlation coefficient. The topological electronic index divided by the solvent contact area does incorporate the charge-size concept associated with hydrogen bonding. The correlation index between the topological electronic index and the solvent contact area is 0.280; the correlation index between the ratio, topological electronic index/solvent contact area, and the solvent contact area alone is 0.028. This shows that the new parameter is less correlated with the denominator (0.028) but more correlated with the numerator (0.955). It appears, from a chemical sense, that in the ratio the charge the charge effect is more important than the size effect.

The modified forms of the topological index do not seem to provide any improvement over that proposed by Kaliszan and co-workers. That suggests that the formal charge could be the best charge parameter to use.

The enthalpy change (related to the bond energies) gives the worst fit. That may indicate that the model of one solute molecule and one solvent molecule is not adequate to describe hydrogen bonding. It does not necessarily mean that a bond energy model should be discarded.

In order for the theoretical descriptor for hydrogen bonding to be considered acceptable or useable, a linear relationship must be generated that has approximately the same (or better) correlation as the empirical parameter, B, being replaced. With McVol, PI and T(E)/SCA as independent variables the multiple correlation coefficient for log Kow as the dependent variable is 0.914. With McVol, PI and B the multiple correlation coefficient is 0.957. Consequently the theoretical descriptor, T(E)/SCA, cannot replace the empirical hydrogen bonding descriptor, B, and achieve similar levels of precision. The descriptor, T(E)/SCA, does satisfy the condition that there should be little correlation between it and the other two variables in (eqn.8), molecular volume (0.255) and molecular polarizability (-0.196).

It is instructive to note some features of the topological electronic index despite its being an inadequate descriptor (by itself) for this investigation. Molecules with polar groups have higher values than those without. For the same type of functional group molecules with longer hydrocarbon chains tend to have smaller values. These observations are consistent with (eqn.5).

5 RECOMMENDATIONS

To continue the search for a molecular descriptor for hydrogen bonding the following models and their combinations might be promising. Some of these suggested models are small variations on the models used in this paper.

5.1 Quantum Mechanical

- A) Divide the topological electronic index by the fraction of the total area that is accessible to the solvent. The fractional area might be a better size descriptor than the solvent contact area.
- B) Divide the topological electronic index by the surface area of the atom with the most negative formal charge. The atomic surface area might be a better size descriptor than the solvent contact area.
- C) Use the difference between the formal charge on the most electronegative atom when the molecule is near a water molecule and when it is isolated. This value would be a measure of the effect of having a hydrogen bond which would effect the electron population on atoms near the bond.
- D) Use models consisting of the solute molecule and two or more water molecules. This is a more realistic model for a hydrogen bonding system.
- E) Use the energy of the highest occupied molecular orbital (HOMO). This is some indication of the Lewis base strength particularly if the electrons can be considered as a classical lone pair.

F) Use other molecular orbital and their associated energies and geometry. The presence of a lone pair could indicate involvement in hydrogen bonding.

5.2 Statistical Mechanical

Employ statistical mechanical methods for models consisting of several water and solute molecules. The partition coefficient is a macroscopic property; therefore it represents the interaction of a large number of molecules. In principle such a system can be analyzed with quantum mechanics; however, the computations required are prohibitive because they involve interactions between the large number of atoms. Statistical mechanical calculations should be less lengthy because they involve interactions between the molecules which will be smaller in number than the atoms.

5.3 Data Analysis And Mathematical Models

The descriptors could further be analyzed using the statistical bookdiques associated with principle component analysis (18). A set of descriptors (and their combinations) can be analyzed to find those which seem to give the better correlations. It may be possible to find linear combinations which can be treated as new parameters. In this regard a statistical software package with spreadsheet capabilities is useful; sets of data can be readily manipulated in order to get various combinations.

Other mathematical models could be examined. While the linear model is convenient and can more easily be interpreted in terms of (eqn.3) it is possible that other functions may work well. For example a quadratic term for one or more of the descriptors might give an equation that better fits the data. The overall goal is to find molecular properties which can be quantitatively related to empirical properties. While doing this, it is also important to be able to attach physical significance to the descriptors, and mathematical terms and factors that occur in any equation that comes out of the analysis.

Table A Values of Selected Molecular Descriptors

Table A (wntinued)

```
36.5 .0859
39 m.1k39
                        .40
                                                          54.2
                             .40 - .65
                                       1.980 54.25 36.6
                                                                  72.5
                        .40
                                                          59.7
40 mjk40
           54.2 .0927
                             .45 -.30
                                       2.693 49.69 45.1
                                                                 121.5
                       .40
                                  .28
41 m.1k41
          71.3 .0969
                             .45
                                       2.782 39.02 50.1
                                                          55.5
                                                                 139.4
42 m.1k42
          72.1 .0955
                       .40
                                  .05
                                       3.422 47.46 50.1
                                                          68.3
                                                                 171.4
                             .51
                                                          52.2
43 mJk43
          89.8 .0980
                       .40
                                  .99
                                       3.015 33.57 57.7
                                                                 174.0
                             .45
44 m.1k44
          89.4 .0982
                       .40
                             .45
                                  .76
                                       3.127 34.98 56.6
                                                          55.2
                                                                 177.0
                                                                 193.8
45 m.tk45
          89.7 .0976
                       .40
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                                  .61
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.45 1.48
                                       4.108 46.11 52.9
                                                          77.7
          89.1 .0978
46 mjk46
                                                                 189.4
47 mjk47 107.4 .0995
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49 mjk49 108.2 .0981
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                                       2.766 23.22 68.2
56 mjk56 119.1 .1204
                       .90
                             .48 1.58
                                                          40.6
                                                                 188.6
                             .33 2.28
57 mjk57 131.4 .1252
                       .90
                                       3.176 24.17 71.1
                                                          44.7
                                                                 225.8
58 mjk58 100.8 .1249
                       .92
                            .44 1.48
                                       1.985 19.69 62.9
                                                          31.6
                                                                124.9
59 mjk59 101.8 .1209
                       .54
                            .11 2.69
                                       0.623 6.12 61.7
                                                          10.1
                                                                 38.4
60 mjk60 109.
                                       3.280 30.09 66.5
                             .22 2.11
                .1237
                       .73
                                                          49.2
                                                                218.4
61 mjk61 126.4 .1224
                       .69
                            .23 2.51
                                       4.054 32.07 72.6
                                                          55.9
                                                                294.3
62 mjk62 144.3 .1208
                                       4.150 28.76 80.0
                            .23 3.18
                       .65
                                                          51.9
                                                                332.0
                       .71
63 mjk63
         99.8 .1237
                             .07 2.84
                                       1.352 13.55 67.0
                                                          20.2
                                                                  90.6
64 mjk64 105.8 .1280
                       .79
                             .06 2.99
                                       1.085 10.26 71.2
                                                          15.2
                                                                  77.3
                       .90
                             .38 1.56
65 mjk65
         99.7 .1276
                                       1.076 10.79 64.2
                                                          16.8
                                                                 69.1
                       .70
66 mjk66 101.7 .1307
                            .14 1.85
                                       2.684 26.39 70.0
                                                          38.4
                                                                 187.9
                             .15 3.42
                                       1.605 11.76 76.5
67 mjk67 136.5 .1210
                       .41
                                                          21.0
                                                                122.8
68 mjk68 118.9 .1212
                       .47
                             .13 3.20
                                      1.102 9.27 69.7
                                                          15.8
                                                                 76.8
                       .90
                            .40 2.21
69 mjk69 134.7 .1224
                                       5.092 37.80 72.9
                                                          69.8
                                                                371.2
                             .35 2.61
                                       3.236 21.70 77.3
70 mjk70 149.1 .1257
                       .85
                                                          41.9
                                                                250.1
71 mjk71 167.5 .1175
                       .85
                             .35 3.31
                                       4.507 26.91 80.1
                                                          56.3
                                                                361.0
                       .88
72 mjk72 137. .1186
                            .48 2.20 2.819 20.58 74.0
                                                          38.1
                                                                208.6
```

Table B contains the names of the compounds keyed to the numbers,#. II is the solvatochromatic polarizability descriptor.

B is the solvatochromatic hydrogen bonding basicity descriptor.

iotes:

^{*}P3 means times 10 raised to the positive third power.

e represents the atomic charge unit. A is the angstrom.

Table B

List of Compounds in Table A

hexane
cyclohexane 2,2-dimethylpropane pentane
2.2-dimethylpropane
pentane
eyelopentane butane
butane
tetrachloroethene carbon tetrachloride
carbon tetrachloride
tripropyl amine
1-chlorobutane
1,1,1-triehloroethane
propane
trichloroethene
1-chloropropane
triethyl amine
2-hexanone
N-methyl pyridine
ethyl propanoate
2-pentanone
diethyl ether
butanal
cyclohexanone
ethyl ethanoate
ethyl dimethyl amine
propanal
tetrahydrofuran
diethyl acetamide
butanone
hexamethyl phosphoramide
methyl ethanoate nitroethane
ni troetnane
trimethyl amine propanenitrile
proparementurite
dimethyl ether propanone
proparione

36 ethanenitrile 37 nitromethane

38 dimethyl acctamide

39 methanol
40 ethanol
41 n-propanol
42 2-propanol
43 n-butanol
44 2-methyl-1-propanol
45 2-butanol
46 2-methyl-2-propanol
47 1-pentanol
48 3-pentanol
49 2,2-dimethyl-1-propanol
50 2-methyl-2-bitanol
51 3-methyl-2-butanol
52 1-hexanol
53 3,3-dimethyl-2-butanol
54 benzene 55 ethyl benzoate
56 acetophenone
57 dimethyl amiline
58 benzaldehyde
59 toluene
60 methoxy benzene
61 ethoxy benzene
62 propoxybenzene
63 chlorobenzene
64 bromobenzene
65 cyanobenzene
66 nitrobenzene
67 1,3,5-trimethylbenze a
68 m-xylene
69 o-dimethoxy benzene
70 n,n-dimethyl amino toluene
71 N,N-diethyl aniline
72 phenyl propanone

Blank

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